

Sensitivity functions for MIMO systems	Some useful math relations
Output sensitivity function: $(I + PC)^{-1} = S$ Input sensitivity function: $(I + CP)^{-1}$ Mini-problem: Find the transfer functions above in the block diagram on the previous slide.	Notice the following identities: (i) $[I + PC]^{-1}P = P[I + CP]^{-1}$ (ii) $C[I + PC]^{-1} = [I + CP]^{-1}C$ (iii) $T = P[I + CP]^{-1}C = PC[I + PC]^{-1} = [I + PC]^{-1}PC$ (iv) $S + T = I$ Proof: The first equality follows by multiplication on both sides with $(I + PC)$ from the left and with $(I + CP)$ from the right. Left: $[I + PC][I + PC]^{-1}P[I + CP] = I \cdot [P + PCP] = [I + PC]P$ Right: $[I + PC]P[I + CP]^{-1}[I + CP] = [I + PC]P \cdot I = [I + PC]P$
Lecture 7 – Outline	Hard limitations from RHP zeros
<ol> <li>Transfer functions for MIMO systems</li> <li>Limitations due to RHP zeros</li> <li>Decentralized control</li> <li>Decoupling</li> </ol>	[G&L Theorem 7.9] Assume that the MIMO system $P(s)$ has a transmission zero $z$ in the RHP. Let $S(s) = [I + P(s)C(s)]^{-1}$ and let $W_S(s)$ be a scalar, stable and minimum phase transfer function. Then the specification $  W_SS  _{\infty} = \sup_{\omega} \bar{\sigma}(W_S(i\omega)S(i\omega)) \le 1$ is only possible to meet if $ W_S(z)  \le 1$
Example: Control of MIMO system with RHP zero	Example – Controller 1
[G&L Example 1.1] Process: $P(s) = \begin{bmatrix} \frac{2}{s+1} & \frac{3}{s+2} \\ \frac{1}{s+1} & \frac{1}{s+1} \end{bmatrix}$ Computing the determinant $\det P(s) = \frac{2}{(s+1)^2} - \frac{3}{(s+2)(s+1)} = \frac{-s+1}{(s+1)^2(s+2)}$ shows that the process has a RHP zero in 1, which will limit the achievable performance. [See lecture notes for details of the following slides]	The controller $C_1(s) = \begin{bmatrix} \frac{K_1(s+1)}{s} & -\frac{3K_2(s+0.5)}{s(s+2)} \\ -\frac{K_1(s+1)}{s} & \frac{2K_2(s+0.5)}{s(s+1)} \end{bmatrix}$ gives the diagonal loop transfer matrix $P(s)C_1(s) = \begin{bmatrix} \frac{K_1(-s+1)}{s(s+2)} & 0 \\ 0 & \frac{K_2(s+0.5)(-s+1)}{s(s+1)(s+2)} \end{bmatrix}$ The system is decoupled into two scalar loops, each with an unstable zero at $s = 1$ that limits the bandwidth. Closed-loop step responses from $(r_1, r_2)$ to $(y_1, y_2)$ for $K_1 = K_2 = 1$ are shown on next slide.
Step responses using Controller 1	Sensitivity sigma plot using Controller 1
Step Response	Singular Values <sup>101</sup> Singular values 





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# Example – Controller 2

The controller

$$C_2(s) = \begin{bmatrix} \frac{K_1(s+1)}{s} & K_2\\ -\frac{K_1(s+1)}{s} & K_2 \end{bmatrix}$$

gives the triangular loop transfer matrix

$$P(s)C_2(s) = \begin{bmatrix} \frac{K_1(-s+1)}{s(s+2)} & \frac{K_2(5s+7)}{(s+2)(s+1)} \\ 0 & \frac{2K_2}{s+1} \end{bmatrix}$$

Now the decoupling is only partial: Output  $y_2$  is not affected by  $r_1$ . Moreover, there is no RHP zero that limits the rate of response in  $y_2$ !

The closed loop step responses for  $K_1=1,\,K_2=10$  are shown on next slide.

## Sensitivity sigma plot using Controller 2







The RHP zero does not prevent a fast  $y_1$  response to  $r_1$  but at the price of a simultaneous undesired response in  $y_2.$ 

## Example – summary

To summarize, the example shows that even though a **multivariable RHP zero always gives a performance limitation**, it is **possible to influence** where the effects should show up.

#### Step responses using Controller 2



The RHP zero does not prevent a fast  $y_2$  response to  $r_2$  but at the price of a simultaneous undesired response in  $y_1.$ 

## **Example – Controller 3**

The controller

$$C_3(s) = \begin{bmatrix} K_1 & \frac{-3K_2(s+0.5)}{s(s+2)} \\ K_1 & \frac{2K_2(s+0.5)}{s(s+1)} \end{bmatrix}$$

gives the triangular loop transfer matrix

$$P(s)C_3(s) = \begin{bmatrix} \frac{K_1(5s+7)}{(s+1)(s+2)} & 0\\ \frac{2K_1}{s+1} & \frac{K_2(-1+s)(s+0.5)}{s(s+1)^2(s+2)} \end{bmatrix}$$

In this case  $y_1$  is decoupled from  $r_2$  and can respond arbitrarily fast for high values of  $K_1$ , at the expense of bad behavior in  $y_2$ . Step responses for  $K_1 = 10$ ,  $K_2 = 1$  are shown on next slide.

## Sensitivity sigma plot using Controller 3



 $W_S(s) = \frac{s+1}{2s}$ , impossible to meet due to RHP zero

## Lecture 7 – Outline

- Transfer functions for MIMO systems
- 2 Limitations due to RHP zeros
- 3. Decentralized control
- 4. Decoupling

#### **Decentralized control**

#### Interaction between simple loops

Background in process control:

- A few important variables were controlled using the simple loop paradigm: one sensor, one actuator, one controller
- As more loops were added, interaction was handled using feedforward, cascade and midrange control, selectors, etc.
- Not always obvious how to associate sensors and actuators the pairing problem

Computer control and state-space design methods eventually led to centralized MIMO control schemes (LQG, MPC, etc.)

## Rosenbrock's example

$$P(s) = \begin{cases} \frac{1}{s+1} & \frac{2}{s+3} \\ \frac{1}{s+1} & \frac{1}{s+1} \end{cases}$$

Very benign subsystems (compare with example in [G&L, Ch.1]).

The transmission zeros are given by the roots of

$$\det P(s) = \frac{1}{s+1} \left( \frac{1}{s+1} - \frac{2}{s+3} \right) = \frac{1-s}{(s+1)^2(s+3)}$$

RHP zero in 1  $\Rightarrow$  cannot robustly control the system with a crossover frequency larger than 1.

## Bristol's relative gain array (RGA)

- Edgar H. Bristol, "On a new measure of interaction for multivariable process control" [IEEE TAC 11(1967) pp. 133–135]
- A simple way of measuring interaction in MIMO systems
- Idea: Study how the gain between one input and one output changes when all other outputs are regulated:

 $\label{eq:relative gain} \text{relative gain} = \frac{\text{open-loop gain}}{\text{closed-loop gain}}$ 

 $\blacktriangleright$  Often only the static gain P(0) is analyzed, but one could also look at for instance  $P(i\omega_c)$ 

#### **Calculation of RGA**

Ratio of open-loop and closed-loop gain:

$$\lambda_{kj} = G_{kj} \cdot G_{jk}^{-1}$$

All elements of the relative gain array (matrix) can be computed as

 $\Lambda = \mathrm{RGA}(G) = G \,. \ast \, (G^{-1})^T$ 

where .\* denotes element-wise (Hadamard/Schur) multiplication

Matlab: RGA = G.\*inv(G).'



What happens when the controllers are tuned individually ( $C_1$  for  $P_{11}$  and  $C_2$  for  $P_{22}$ ), ignoring the cross-couplings?

## Rosenbrock's example with two SISO controllers

$$U_1 = \left(1 + \frac{1}{2}\right)(R_1 - Y_1)$$

•  $U_2 = -K_2 Y_2$  with  $K_2 = 0, 0.8$ , and 1.6.



The second controller has a major impact on the first loop! Gain reversal in  $u_1 \rightarrow y_1$  when  $K_2 = 1.6$ .

## **Calculation of RGA**

Assume a square MIMO system with input-output relation y = Gu.

**Open loop:** Assume  $u_i \neq 0$  and all other inputs zero. This gives

$$y = G_{*j}u_j$$

 ${\rm Output}\ k \text{ is given by}$ 

 $y_k = G_{kj}u_j$ 

**Closed loop:** Assume  $y_k \neq 0$  and that all other outputs are regulated to zero. Solving for the corresponding inputs gives

$$u = G_{*k}^{-1} y_k$$

Input j is given by

$$u_j = G_{jk}^{-1} y_k \quad \Leftrightarrow \quad y_k = \frac{1}{G_{jk}^{-1}} u_j$$

## Properties and interpretation of RGA

- RGA is dimensionless; not affected by choice of units or scaling.
- $\blacktriangleright\,$  RGA is normalized: Rows and columns of  $\Lambda$  sum to 1.
- $\blacktriangleright\,$  Diagonal or triangular plant gives  $\Lambda=I$

Interpretation:

- $\blacktriangleright \ \lambda_{kj} \approx 1$  means small closed-loop interaction. Suitable to pair output k with input j.
- ▶ λ<sub>kj</sub> < 0 corresponds to a sign reversal due to feedback and a risk of instability if output k is paired with input j − avoid!
- 0 < λ<sub>kj</sub> < 1 means that the closed-loop gain is larger than the open-loop gain; the opposite is true for λ<sub>kj</sub> > 1.

**Recommendation:** Pair the outputs and inputs so that corresponding relative gains are positive and as close to 1 as possible.

#### **RGA of Rosenbrock's example**

Analysis of static gain:

$$P(0) = \begin{pmatrix} 1 & 2 \\ 1 & 1 \end{pmatrix}, \quad P^{-1}(0) = \begin{pmatrix} -1 & 2 \\ 1 & -1 \end{pmatrix}$$
$$\Lambda = P(0) \cdot (P^{-1}(0))^T = \begin{pmatrix} -1 & 2 \\ 2 & -1 \end{pmatrix}$$

► Negative value of  $\lambda_{11}$  indicates the problematic sign reversal found previously when  $y_1$  was controlled using  $u_1$ .

• Better to use reverse pairing, i.e. let  $u_2$  control  $y_1$  and vice versa.

## **RGA of non-square systems**

The RGA can also be computed for a general gain matrix G:

$$\operatorname{RGA}(G) = G \cdot (G^{\dagger})^T$$

Here, † denotes the pseudo-inverse (Matlab: pinv)

Example: Distillation column:

$$P(0) = \begin{pmatrix} 4.0 & 1.8 & 5.9\\ 5.4 & 5.7 & 6.9 \end{pmatrix}, \quad \text{RGA}(P(0)) = \begin{pmatrix} 0.28 & -0.61 & 1.33\\ 0.01 & 1.58 & -0.59 \end{pmatrix}$$

Suggested pairing for decentralized control:  $y_1-u_3$ ,  $y_2-u_2$ ,  $u_1$  unused

# Decoupling



Idea: Select decoupling filters  $W_1 \mbox{ and } W_2$  so that the controller sees a diagonal plant:

$$\tilde{P} = W_2 P W_1 = \begin{bmatrix} * & 0 & 0 \\ 0 & * & 0 \\ 0 & 0 & * \end{bmatrix}$$

Then we can use a decentralized controller  ${\boldsymbol{C}}$  with the same diagonal structure.





#### Rosenbrock's example with reverse pairing



# Lecture 7 – Outline

- 1. Transfer functions for MIMO systems
- 2. Limitations due to RHP zeros
- 3. Decentralized control
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#### Decoupling

Many variants/names:

- ▶ Input/conventional/feedforward decoupling:  $\tilde{P} = PW_1$ ,  $W_2 = I$
- Output/inverse/feedback decoupling:  $\tilde{P} = W_2 P$ ,  $W_1 = I$

 ${\it W}_1$  and  ${\it W}_2$  can be static or dynamic systems

**Example:** Static input decoupling:  $W_1 = P^{-1}(0), W_2 = I$ 

## Summary

All real systems are coupled

- Multivariable RHP zeros  $\Rightarrow$  limitations
  - Don't forget process redesign
- Decentralized control one controller per controlled variable
- RGA gives insight for input–output pairing
   Decoupling
- Simpler system SISO design, tuning and operation can be used

Next week: Centralized multivariable design using LQ/LQG